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## Banking crises: identification, propagation, and prediction

Jing, Zhongbo

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*Document Version*

Publisher's PDF, also known as Version of record

*Publication date:*

2015

[Link to publication in University of Groningen/UMCG research database](#)

*Citation for published version (APA):*

Jing, Z. (2015). *Banking crises: identification, propagation, and prediction*. [Thesis fully internal (DIV), University of Groningen]. University of Groningen, SOM research school.

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**Banking Crises:  
identification, propagation, and prediction**

**Zhongbo Jing**

Publisher: University of Groningen, Groningen, The Netherlands

Printed by: Ipskamp Drukkers  
P.O. Box 333  
7500 AH Enschede  
The Netherlands

ISBN: 978-90-367-7982-1 (book), 978-90-367-7981-4 (ebook)

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university of  
 groningen

# **Banking Crises: identification, propagation, and prediction**

**PhD Thesis**

to obtain the degree of PhD at the  
University of Groningen  
on the authority of the  
Rector Magnificus Prof. E. Sterken  
and in accordance with  
the decision by the College of Deans.  
This thesis will be defended in public on  
Thursday 2 July 2015 at 09.00 hours

by

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## Acknowledgements

It must be a great achievement and an exciting experience if someone spends several years to do only one thing and finally he makes it. And this is exactly what I feel after completing my thesis after four years of tough work. Fortunately, I was not alone in the past few years and received great help from a lot of inspiring individuals. Now, it is the moment for me to thank all the people without whom this thesis could not have been finished.

I would like to express my special appreciation and thanks to my supervisors, Jakob de Haan and Jan Jacobs, you have been tremendous mentors for me. I would like to thank Jakob, as you have taught me a lot of skills in research and offered countless valuable comments on this thesis, and you also had a great influence on my development as a researcher, teacher and person. I would like to thank Jan, as you have paid a lot of efforts to go through each part of my writings and discuss each model of the thesis with me. I feel very lucky to have been your PhD candidate and hope to continue work with you in the future.

I am indebted to my Chinese supervisors, Haizhen Yang, Xiaoguang Yang, and Xianhua Wei, you have taught me a lot how to become a qualified scientist in the past few years and have given me many priceless advices for my career. Without your help I could not have finished my Chinese thesis and Groningen thesis within five years. I would like to thank the National Natural Science Foundation of China (NSFC Grant Numbers: 71273257) for supporting my research.

I would also like to thank Prof. Hong Zhao for offering the double PhD program of the University of Groningen and the University of Chinese Academy Sciences, giving me an opportunity to study at both top universities. I really want to thank Arthur de Boer, Joyce Hiemstra, Jenny Hill, Martine Koolman, Rina Koning, Sylvia Luiken, Marianne van Kuiken, Ellen Nienhuis, and Herma van der Vleuten for your great help when I arrived in the Netherlands in 2011 and afterwards.

I am grateful to Tjeerd Boonman, Lammertjan Dam, Paul Elhorst, Niels Hermes, and participants of the PhD conference in FEB for your valuable comments and suggestions on my thesis. I also want to thank participants of a seminar at CIRANO, Montréal and the INFINITI conference in Italy for your fruitful discussions. Thanks

to Paul Elhorst, Sylvester Eijffinger, and Jürgen von Hagen for reading all chapters and for their comments to improve the papers.

In May 2014, I got a job at the School of Management Science and Engineering, Central University of Finance & Economics, and starting of September 2014. I decided to postpone my new job half a year in order to finish my thesis in Groningen as soon as possible. Fortunately, I got permission from the university with the help of my new faculty. I am very grateful to my new colleagues, Wenbin Li, Xiaohai He, Zhidong Liu, Bin Song and Muzi Chen, for your great support and help. It is my honor and pleasure to work with you.

I am thankful to my colleagues Te Bao, Yingdan Cai, Wen Chen, Laksmi Kusumawati, Abdi Oumer, Raun van Ooijen, Anna Samarina, Peter van Santen, Solmaria Halleck Vega, Yan Xu, and Shu Yu. I am also grateful to my friends, Quanrun Chen, Yuwan Duan, Xin Fan, Feng Hu, Qiubin Huang, Suxiao Li, Zhengtao Li, Jia Liu, Ye Liu, Jiyuan Wang, Lan Wang, Xiao Wang, Yuehu Wang, Weiguo Xia, Chengyong Xiao, Bingqian Yan, Yanping Zhao, Tao Zhu, with whom I shared hot pot and barbecue or played football together. My thesis could not have been finished so smoothly and my life in Groningen could not have been so wonderful without all of you.

Special thanks go to my family though words cannot express how grateful I am to my mother-in-law, father-in-law, my sisters, my mother, and my father for the sacrifices you have made for me. And last, but not least, I would like to express appreciation to my beloved wife Ying Zhou for standing by me whenever I felt happy or depressed. You are the greatest achievement I have made in my life.

Zhongbo Jing

Groningen January 2015

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